

CS-205 lecture 12:

Laziness & some perspectives on functional programming

Cécilia Pradic

10/11/23

Updated submission date: Friday 17th November 11am

- Please submit something before Tuesday to check you understand the submission instructions.
 - I know that more than $\frac{2}{3}$ rd of you have not yet!
- Won't answer any CW-related queries after Tuesday

Link to submit your coursework

<https://csautograder.swansea.ac.uk/web/project/69>

Last time: the Monad typeclass

```
(>>=) :: Monad m => m a -> (a -> m b) -> m b  
return :: Monad m => a -> m a
```

- $m :: * \rightarrow *$ is a variable, but not for a type
- Monads consist of a very generic, yet useful abstractions
- Typical instances: **Monad IO**, **Monad []**, **Monad Maybe**,
Monad (Cont r), **Monad (State s)**
- **Monad (State s)** = code “as if” we had mutable variables

Maybe the next example to look at if you are interested

A fun example of a monad on canvas

The discrete probability monad

- A way of computing with distributions

(advantage over using random in **IO**)

- Exercise for the interested: run those
- See the file probabilityMonadExample.hs

```
data Dist a = Dist [(a, Double)]
```

```
return :: a -> Dist a
```

```
return x = [(x, 1)]
```

```
(>>=) :: Dist a -> (a -> Dist b) -> Dist b
```

```
(Dist xs) >>= f = Dist [ (x, p * q) | (y, p) <- xs,  
                                let Dist ys = f y,  
                                (x, q) <- ys ]
```

```
runDist :: Dist a -> IO a -- exercise!
```

Laziness & a fancy example

Lazy evaluation

With FP languages, there are two popular kind of evaluation strategies

$(\lambda x \rightarrow x + x) (1+2)$

- **Eager/CBV**: evaluate arguments first

$$\begin{aligned}(\lambda x \rightarrow x + x) (1 + 2) &\rightarrow (\lambda x \rightarrow x + x) 3 \\ &\rightarrow (\lambda x \rightarrow x + x) 3 \\ &\rightarrow 3 + 3 \\ &\rightarrow 6\end{aligned}$$

- **Lazy/CBN**: substitute arguments in the function body first

$$\begin{aligned}(\lambda x \rightarrow x + x) (1 + 2) &\rightarrow (1 + 2) + (1 + 2) \\ &\rightarrow 3 + (1 + 2) \\ &\rightarrow 3 + 3 \\ &\rightarrow 6\end{aligned}$$

In pure functional programming languages, the evaluation strategy mostly does not matter for the result!

- Haskell is **lazy**. (there are pros/cons with that)
- It tries to avoid to duplicate computations

(**call-by-need strategy**)

$$\begin{aligned}(\lambda x \rightarrow x + x) (1 + 2) &\rightarrow (1 + 2) + (1 + 2) \\ &\rightarrow 3 + 3 \\ &\rightarrow 6\end{aligned}$$

Pro/Cons laziness

Pros:

- Call-by-need can save some shared computation at low intellectual cost
→ nice for rapid prototyping of complicated code
- Some nice idiosyncratic applications in the next slide

Cons:

- Harder to reason about complexity
- Counter-intuitive
- More complicated runtime because thunking is necessary
- `unsafePerformIO` has really hard-to-predict behaviours
- laziness can easily be emulated in eager languages

(essentially replace `a by () -> a`)

Some applications

- Infinite values can be used seamlessly in the language

```
allNats :: [Int]
```

```
allNats = 0 : map (+1) allNats
```

```
-- >>> take 5 allNats
```

```
-- [0,1,2,3,4]
```

- Nice tricks, like support for memoization/dynamic programming **without side-effects or state monad**

Not possible in eager FP languages

Next slides: explanation of the dynamic programming example in `lecture11.hs`

Extended example: binomial (1/4)

Problem

Compute the number of ways $\binom{n}{k}$ to pick k elements among n .

$$\binom{4}{2} = \#\left\{ \begin{array}{c} \text{●} \\ \text{●} \\ \text{○} \\ \text{○} \end{array}, \begin{array}{c} \text{○} \\ \text{○} \\ \text{●} \\ \text{○} \end{array}, \begin{array}{c} \text{○} \\ \text{○} \\ \text{●} \\ \text{●} \end{array}, \begin{array}{c} \text{○} \\ \text{○} \\ \text{○} \\ \text{●} \end{array}, \begin{array}{c} \text{○} \\ \text{○} \\ \text{○} \\ \text{●} \end{array}, \begin{array}{c} \text{○} \\ \text{○} \\ \text{○} \\ \text{●} \end{array} \right\}$$

Extended example: binomial (1/4)

Problem

Compute the number of ways $\binom{n}{k}$ to pick k elements among n .

$$\binom{4}{2} = \#\left\{ \begin{array}{c} \text{⦿} \\ \text{⦿} \\ \text{⦿} \\ \text{⦿} \end{array} \right\}$$

The diagram shows six circles, each containing four smaller circles. The top two circles in each of the six circles are red, and the bottom two are yellow. The six circles represent different combinations of two red and two yellow circles, illustrating the six ways to choose 2 elements from a set of 4.

$$\binom{n}{k} = \#\{X \subseteq \{1, \dots, n\} \mid \#X = k\} = \frac{n!}{k!(n-k)!}$$

Extended example: binomial (1/4)

Problem

Compute the number of ways $\binom{n}{k}$ to pick k elements among n .

$$\binom{4}{2} = \#\left\{ \begin{array}{c} \text{⦿} \\ \text{⦿} \end{array}, \begin{array}{c} \text{⦿} \\ \text{⦿} \end{array}, \begin{array}{c} \text{⦿} \\ \text{⦿} \end{array}, \begin{array}{c} \text{⦿} \\ \text{⦿} \end{array}, \begin{array}{c} \text{⦿} \\ \text{⦿} \end{array}, \begin{array}{c} \text{⦿} \\ \text{⦿} \end{array} \right\}$$

$$\binom{n}{k} = \#\{X \subseteq \{1, \dots, n\} \mid \#X = k\} = \frac{n!}{k!(n-k)!}$$

Issue with the closed formula: $n!$ overflows fast while $\binom{k}{n}$ is polynomial if $k = O(1)$.

Alternative way of computing?

Extended example: binomial (2/4)

Decomposition by fixing an element and asking whether it is picked or not.

$$\begin{aligned} \binom{4}{2} &= \# \left\{ \begin{array}{c} \text{●} \\ \text{●} \\ \text{○} \\ \text{○} \end{array}, \begin{array}{c} \text{●} \\ \text{○} \\ \text{○} \\ \text{○} \end{array}, \begin{array}{c} \text{○} \\ \text{○} \\ \text{○} \\ \text{●} \end{array} \right\} = \# \left\{ \begin{array}{c} \text{●} \\ \text{○} \\ \text{○} \\ \text{○} \end{array}, \begin{array}{c} \text{○} \\ \text{○} \\ \text{○} \\ \text{○} \end{array}, \begin{array}{c} \text{○} \\ \text{○} \\ \text{○} \\ \text{○} \end{array} \right\} \\ &+ \# \left\{ \begin{array}{c} \text{○} \\ \text{○} \\ \text{○} \\ \text{○} \end{array}, \begin{array}{c} \text{○} \\ \text{○} \\ \text{○} \\ \text{○} \end{array}, \begin{array}{c} \text{○} \\ \text{○} \\ \text{○} \\ \text{○} \end{array} \right\} = \# \left\{ \begin{array}{c} \text{○} \\ \text{○} \\ \text{○} \\ \text{○} \end{array}, \begin{array}{c} \text{○} \\ \text{○} \\ \text{○} \\ \text{○} \end{array}, \begin{array}{c} \text{○} \\ \text{○} \\ \text{○} \\ \text{○} \end{array} \right\} \\ &= \binom{3}{1} + \binom{3}{2} \end{aligned}$$

Extended example: binomial (2/4)

Decomposition by fixing an element and asking whether it is picked or not.

$$\begin{aligned} \binom{4}{2} &= \# \left\{ \begin{array}{c} \text{blue} \\ \text{red} \\ \text{white} \end{array} \right\} + \# \left\{ \begin{array}{c} \text{red} \\ \text{white} \\ \text{blue} \end{array} \right\} \\ &= \# \left\{ \begin{array}{c} \text{red} \\ \text{white} \\ \text{blue} \end{array} \right\} + \# \left\{ \begin{array}{c} \text{blue} \\ \text{white} \\ \text{red} \end{array} \right\} \\ &= \binom{3}{1} + \binom{3}{2} \end{aligned}$$

$$\binom{n}{k} = \binom{n-1}{k-1} + \binom{n-1}{k}$$

Extended example: binomial (3/4)

```
binom :: Int -> Int -> Int
```

```
binom k n | k > n = 0
```

```
binom 0 n      = 1
```

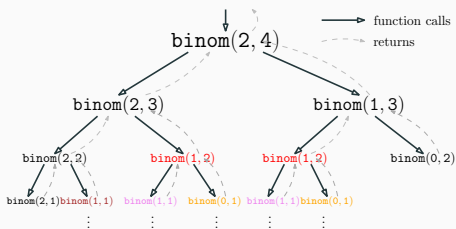
```
binom k n      = binom (k-1) (n-1) + binom k (n-1)
```

Proof of termination: by induction over n .

Extended example: binomial (3/5)

Issue: exponential number of calls

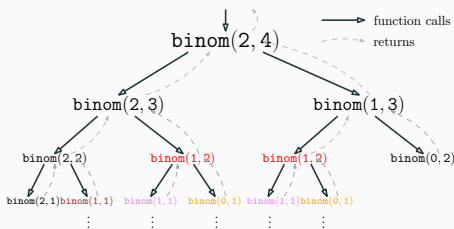
(inefficient)



Extended example: binomial (3/5)

Issue: exponential number of calls

(inefficient)



But there are redundant calls!

- Dynamic programming/memoization: cache the common subcomputations!

Extended example: binomial (4/4)

```
binomial :: Int -> Int -> Int
binomial k n | k > n      = 0
              | otherwise = a ! (k, n)
              where a = array ((0,0),(k,n))
                             [ ((i,j), b i j) | i <- [0..k],
                                                j <- [0..n]]

              b 0 k = 1
              b i j | i == j = 1
              b i j = (a ! (i,j-1)) + (a ! (i-1,j-1))
```

Some caveats:

- The imperative implementation might be more straightforward
- Also does not mesh well with **hash-consing** if the input domain is more complex

Simulated in other languages

Requires **state** to simulate call-by-need

```
final int N = 100;
final int K = 20;

final int[][] cache = new Array[K][N];
//assume that main() initializes cache with -1

static int binom(int k, int n)
{
    if (cache[k][n] != -1)
        return cache[k][n];
    if (k > n)
        return cache[k][n] = 0;
    if (k == 0)
        return cache[k][n] = 1;
    else
        return cache[k][n] = binom(k-1,n-1) + binom(k,n-1);
}
```

(Can be done in pure eager languages via a state monad)

Laziness by default

- introduces a lot of complexity for optimizing programs
(not asymptotically, but up to a constant)
- complexifies the runtime
- (was historically a **strong** reason for haskell existing)
- is **sometimes** nice when prototyping **roughly**
(CBNeed alone not as good as nice memoization/hash-consing)
(and benefits don't stack)

Some perspectives on functional programming

What have we learned?

Began to program in a very opinionated FP language

- only **pure functions** by default

Some new features we focused on:

- recursive definitions (OK not new, but...)
- parametric polymorphism `fst :: (a, b) -> a`
- algebraic datatypes
`data AST = Var String | App AST AST | Lambda String AST`
- lambdas (anonymous functions) `\ x -> (x, x^2)`
- higher-order functions (map, filter)
- type classes (Show, Monad, ...)

Transferable skills?

Other functional programming languages

OCaml



- The most mainstream ML dialect (Milner)
- Eager (more performance-oriented)
- No typeclasses, more sophisticated module system
- Similar type system based on HM
- Industry variants: F# (M\$), ReasonML (FB), Bucklescript

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LISP:

- Designates a variety of languages (ex: Scheme)
- Typically dynamically typed, based on lists
- Scripting language for emacs among others

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FP design also had significant influence on

Scala, Erlang, Rust, Mathematica, javascript (!)

More hardcore FP stuff?

Advanced topics in Haskell/OCaml:

- Metaprogramming (generics/template/BER)
- GADTs
- higher-kinds

Most hardcore FP languages

Dependently-typed languages: Coq, Lean, Agda, Idris

- Mixes types and values
 - Type system rich enough to **do mathematics in**
 - Proof assistants/interactive theorem prover
-
- Expertise on those topics in the theory group in Swansea
(options for projects)

Functional features in more mainstream languages

In Python, Java, javascript and C++:

- Historically, objects to simulate higher-order functions
(cumbersome, requires class definitions)
- Lately: introduction of **lambdas** (anonymous functions)
- Various level of gracefulness...
(beware of lexical/dynamic scoping and typing)

For quick reference

<https://learnxinyminutes.com/> and search “lambda”

Lambdas in C++11

Some example from an old student project:

```
auto it = find_if(points.begin(),
                 points.end(),
                 [&f](Vertex * v){
                     return *v == *(f.points[0]); });
```

- The good: static scoping, clear semantics for closures
- The ugly: the type of a λ is compiler/OS-dependent?
 - Not too much of a hassle when using type inference with **auto**
 - Except for the type errors

Lambdas in Java

Example from some labwork for another module:

```
public static void main(String[] args) throws Exception
{
    Random r = new Random();
    Graph g = new Graph(5, x -> y -> x != y && r.nextInt() % 3 == 0);
    g.toDotFile("myExample");
}
```

```
public Graph(int size,
              Function<Integer,Function<Integer, Boolean>> gen)
```

- The good: static scoping
- The bad: limited support for closures

Lambdas and list comprehension in Python

```
>>> list(map(lambda y: y*y, \
             filter(lambda x: x%5 == 2, range(0,70)))) \
      ))
[4, 49, 144, 289, 484, 729, 1024, 1369, 1764, 2209, 2704, 3249, 3841]
```

```
>>> [ x * x for x in range(0,70) if x%5 == 2 ]
[4, 49, 144, 289, 484, 729, 1024, 1369, 1764, 2209, 2704, 3249, 3841]
```

- The good: reasonable syntax
- The bad: dynamical scoping

Programming with recursion?

Huge issue in “mainstream languages” for complex programs:

- The call stack is of ridiculously small size (4Ko)
- Lots of recursive calls \Rightarrow premature stack overflows

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- (Less of an issue in Haskell due to laziness)

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Solution

Tail-call optimization

Tail-call optimization in an example

The following OCaml code is **tail-recursive**

(value in the recursive call = returned value)

```
let rec findZero f = function  
  [] -> None  
| head :: _ when f head = 0 -> Some head  
| _ :: tail -> findZero f tail
```

morally optimized into a while loop \Rightarrow no stack pointers/overflows

- Common: recursive def \mapsto tail-rec def using an **accumulator**
(you will see that during prolog)

The equivalent while loop if you are curious

Still in OCaml

(one can program in an imperative style there)

(although non-idiomatic)

```
let findZero (f : 'a -> int) (xs : 'a list) : 'a option =  
  let r = ref None in let ys = ref xs in  
  while !r = None && !ys != [] do  
    let head :: tail = !r in  
    if f head = 0 then  
      r := Some head  
    else ys := tail  
  done; !r
```

(in truth the compiler does this at a lower level)

But outside of the FP world...

Warning

Some **big** compilers/interpreters **don't** implement TCO optimization!!

- Historical culprits: python or java...
- javascript: browser-dependent

⇒ in those languages, iterative solutions are ultimately going to be more efficient

So in conclusion

- I hope you had fun and retain some things
- From Monday: no more lectures from me
- My office hours: only the next two weeks
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I wish you a nice continuation of your studies!